

# Global monitoring



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MODIS time-series imagery were processed to estimate year 2000 percent tree cover and 2000 to 2010 forest cover loss.

Remote sensing-derived change products such as this quantify the biophysical extent and loss of forest cover. While absent of land use considerations, they improve the consistency of forest area and change estimates across space and through time.

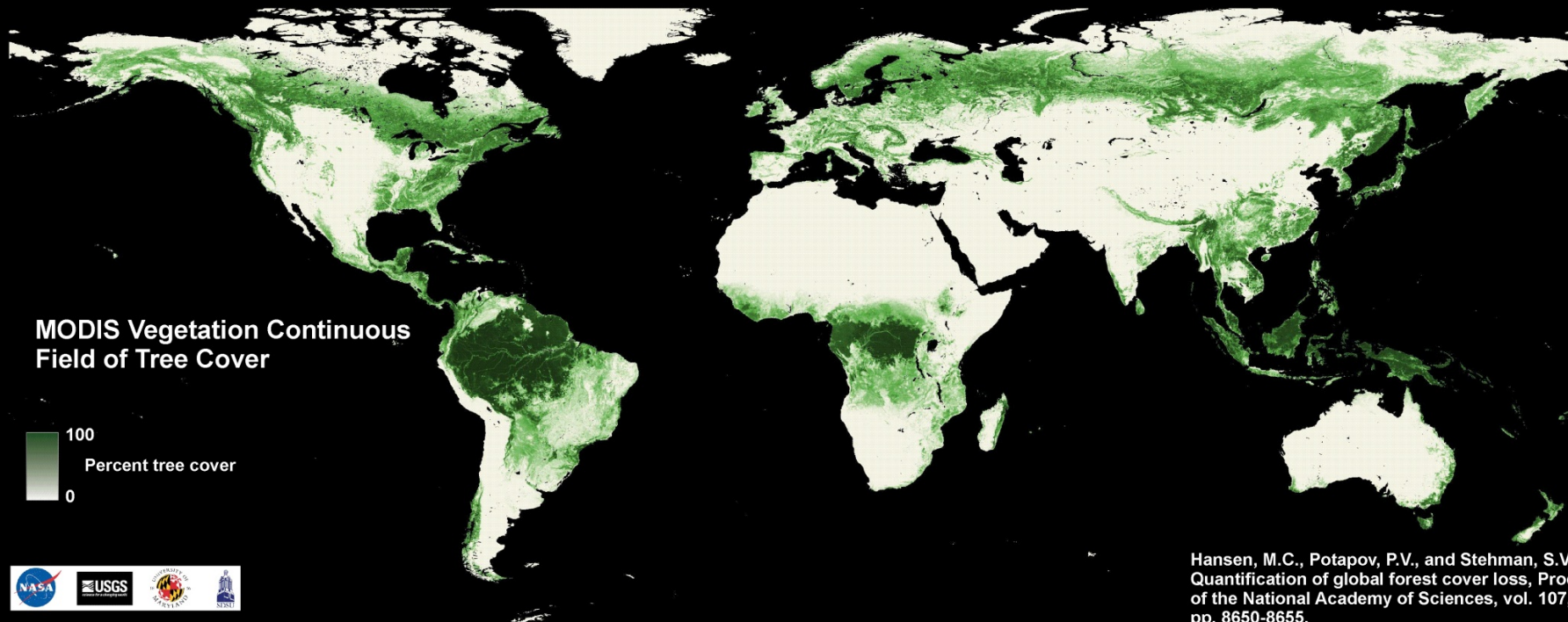
Results illustrate a pervasive global forest cover loss dynamic with a reduction in gross forest cover loss in 2005 to 2010 compared to 2000 to 2005, largely attributable to a slowing of deforestation in Brazil.

While this depiction of change does not provide attribution of the drivers of forest cover loss, principal causes include clearing for agriculture, such as soybean expansion in South America, palm estates and timber plantations in Insular Southeast Asia, logging and disease in North America, and fire across the boreal biome.

The Americas account for more than half of all global gross forest cover loss for both epochs with a number of drivers contributing including logging, fire, disease and storm damage.

Africa has the lowest proportional change due to a lack of large scale agro-industrial investment. Most forest conversion in Africa is due to small-scale subsistence farming practices.

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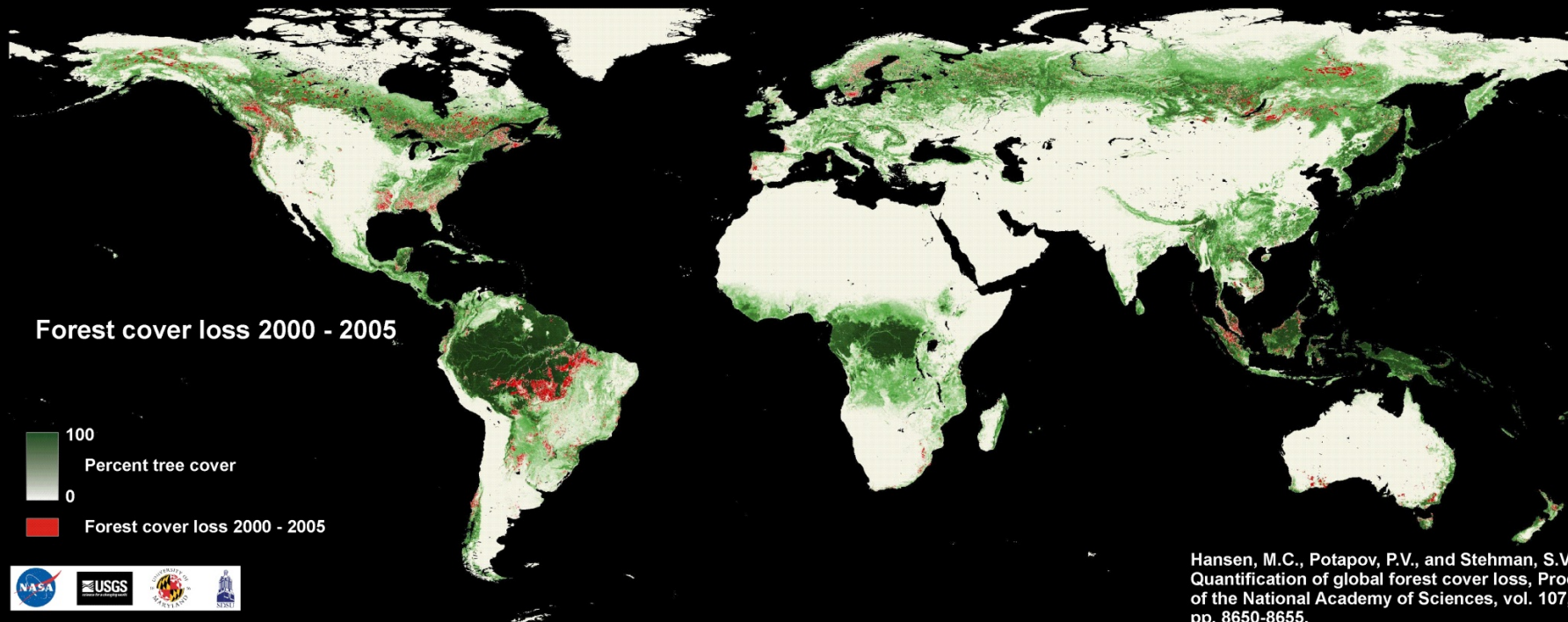
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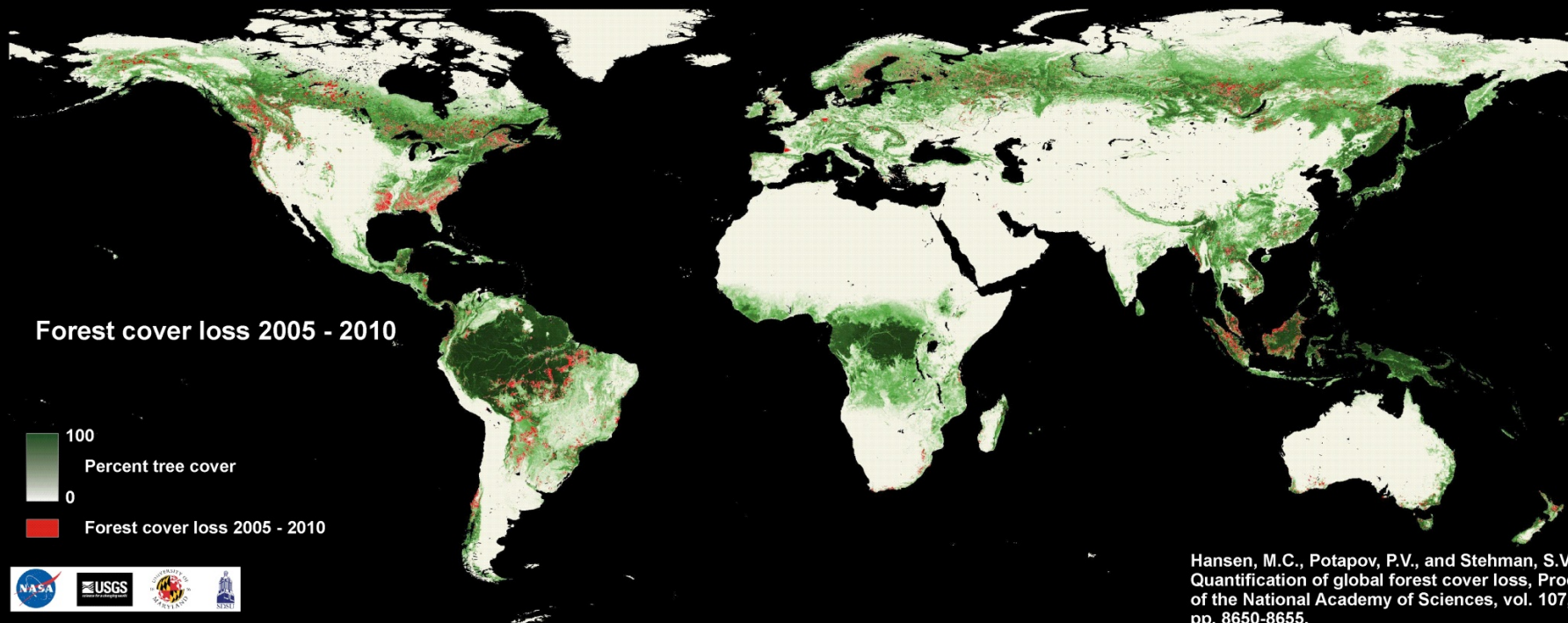
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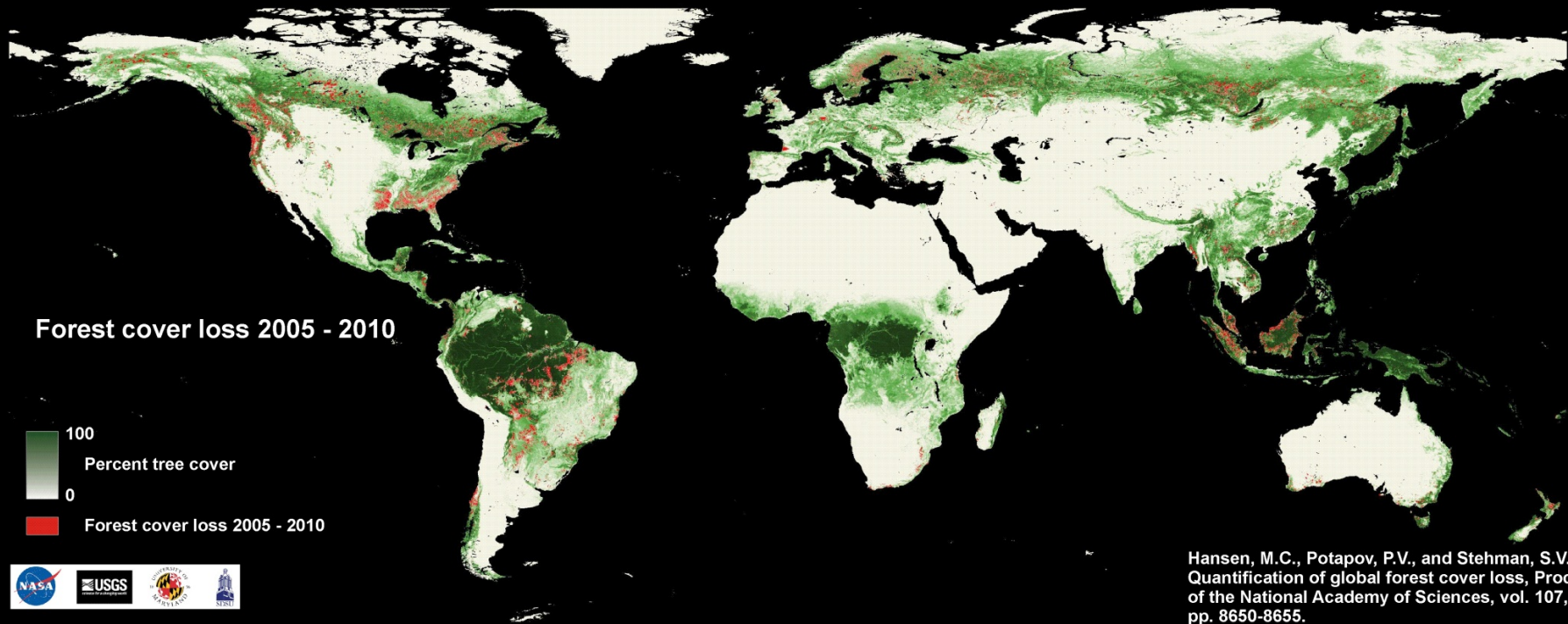
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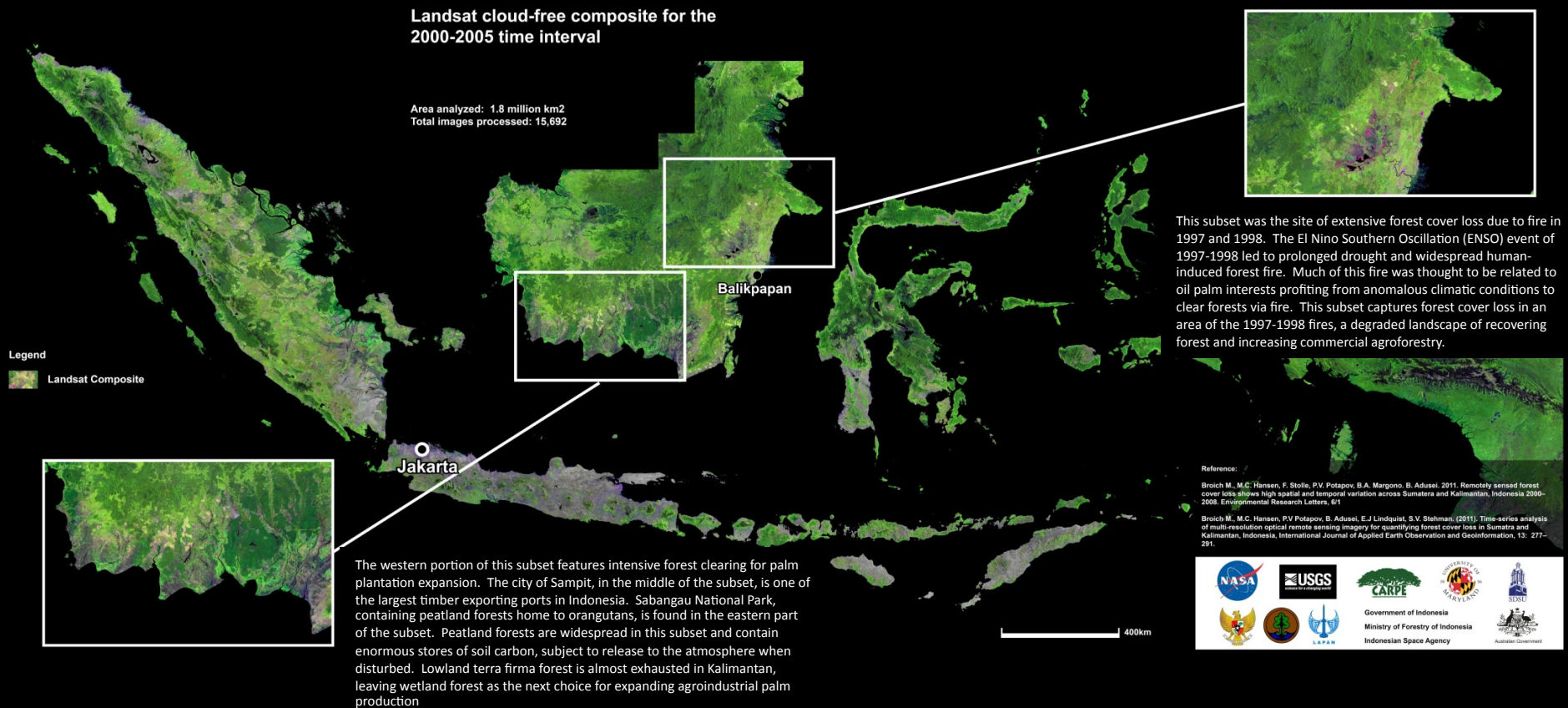
# Global monitoring



## Preliminary findings:

- ↓ Humid tropics – dramatic decrease in Brazilian Amazon forest cover loss, increased loss in Indonesia and Malaysia
- ↑ Dry tropics – increased forest cover loss in Argentina, Paraguay, Bolivia and southern Africa
- ↓ Boreal – decrease in North American forest loss, increased loss in Russia
- ↔ Temperate – no significant change in magnitude of forest cover loss

# Indonesia forest monitoring



Application of the Landsat processing and characterization method for Indonesia is supported by the Indonesia-Australia Forest Carbon Partnership (IAFCP) in collaboration with the Indonesian Space Agency, the Indonesian Ministry of Forestry and the Indonesian National Coordinating Agency for Surveys and Mapping. Timely forest cover extent and change data are required for the Indonesian National Carbon Accounting System (INCAS) whose objectives include the provision of a comprehensive and credible accounting of Indonesia's land-based carbon emissions. Methods development was supported by NASA's Land Cover and Land Use Change program and USAID with additional support from USGS.

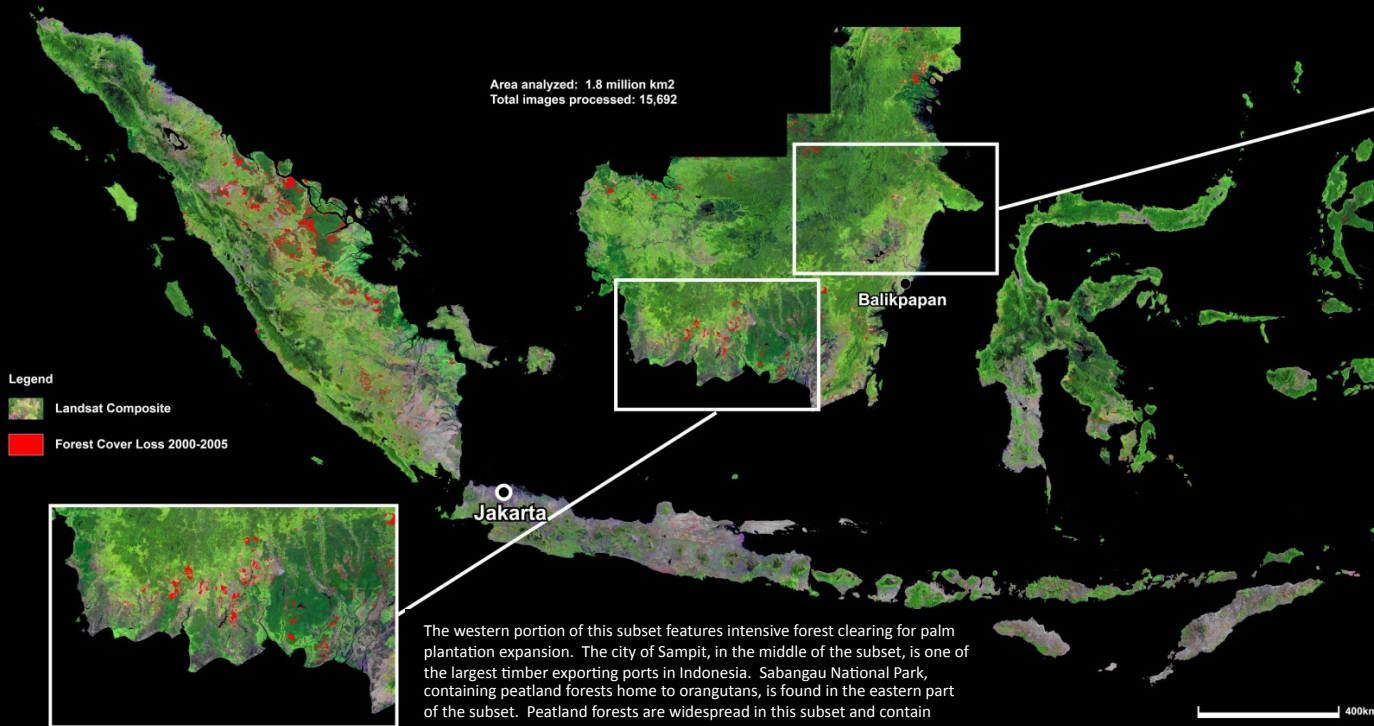
An exhaustive mining of the Landsat ETM+ archive was performed to map forest cover extent and loss for Indonesia from 2000 to 2010. All Landsat imagery were processed to radiometrically normalized reflectance values and subsequently used to produce time-sequential image composites. The method relied on MODIS-derived surface reflectance data as a normalization target for Landsat image processing. Supervised learning algorithms were then applied to the time-series data sets to quantify both forest cover extent and loss.



# Indonesia forest monitoring

## Forest Cover Loss 2000-2005

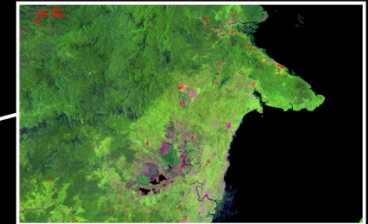
Area analyzed: 1.8 million km<sup>2</sup>  
Total images processed: 15,692



Legend

- Landsat Composite
- Forest Cover Loss 2000-2005

The western portion of this subset features intensive forest clearing for palm plantation expansion. The city of Sampit, in the middle of the subset, is one of the largest timber exporting ports in Indonesia. Sabangau National Park, containing peatland forests home to orangutans, is found in the eastern part of the subset. Peatland forests are widespread in this subset and contain enormous stores of soil carbon, subject to release to the atmosphere when disturbed. Lowland terra firma forest is almost exhausted in Kalimantan, leaving wetland forest as the next choice for expanding agroindustrial palm production



This subset was the site of extensive forest cover loss due to fire in 1997 and 1998. The El Nino Southern Oscillation (ENSO) event of 1997-1998 led to prolonged drought and widespread human-induced forest fire. Much of this fire was thought to be related to oil palm interests profiting from anomalous climatic conditions to clear forests via fire. This subset captures forest cover loss in an area of the 1997-1998 fires, a degraded landscape of recovering forest and increasing commercial agroforestry.

### Reference:

Broich M., M.C. Hansen, F. Stolle, P.V. Potapov, B.A. Margono, B. Adusei, 2011. Remotely sensed forest cover loss shows high spatial and temporal variation across Sumatra and Kalimantan, Indonesia 2000-2008. *Environmental Research Letters*, 6:1

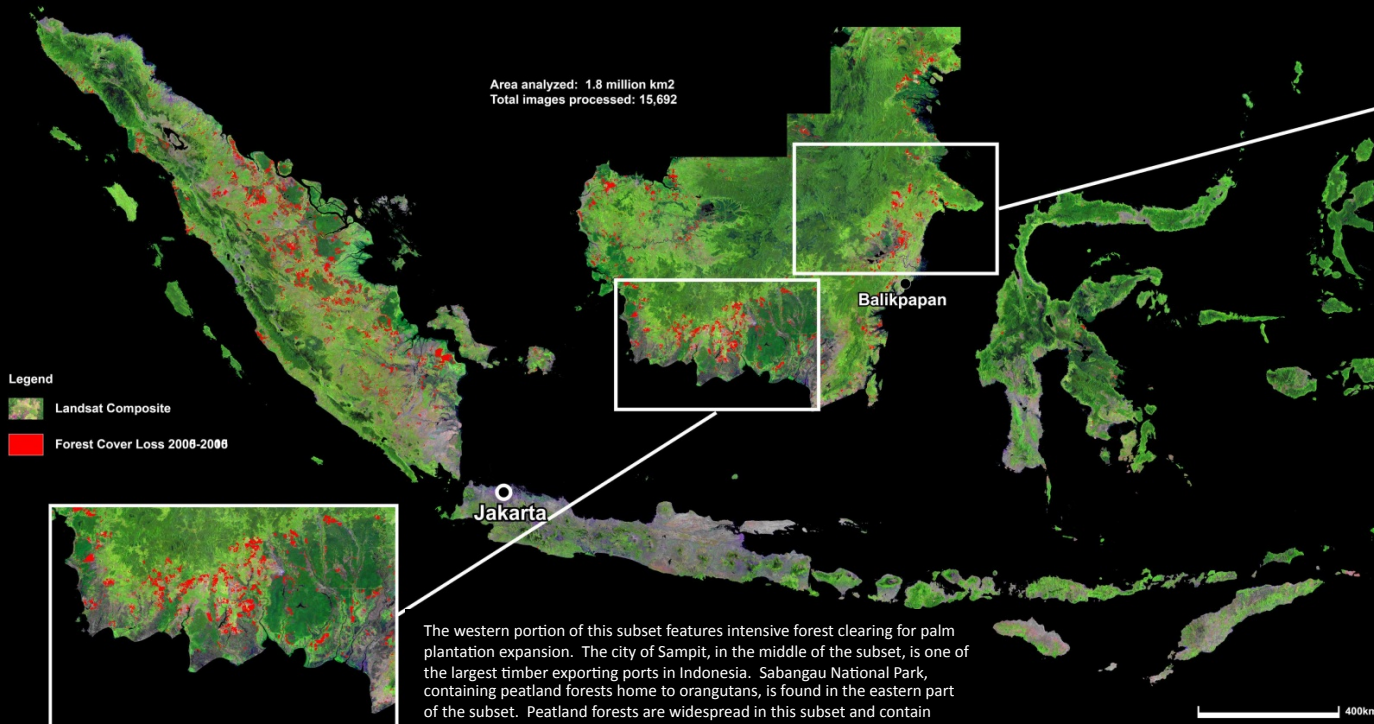
Broich M., M.C. Hansen, P.V. Potapov, B. Adusei, E.J. Lindquist, S.V. Stehman, (2011). Time-series analysis of multi-resolution optical remote sensing imagery for quantifying forest cover loss in Sumatra and Kalimantan, Indonesia, *International Journal of Applied Earth Observation and Geoinformation*, 13: 277-291.



# Indonesia forest monitoring

## Forest Cover Loss 2005-2010

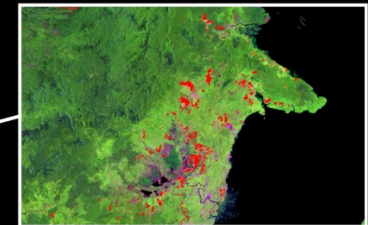
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Legend

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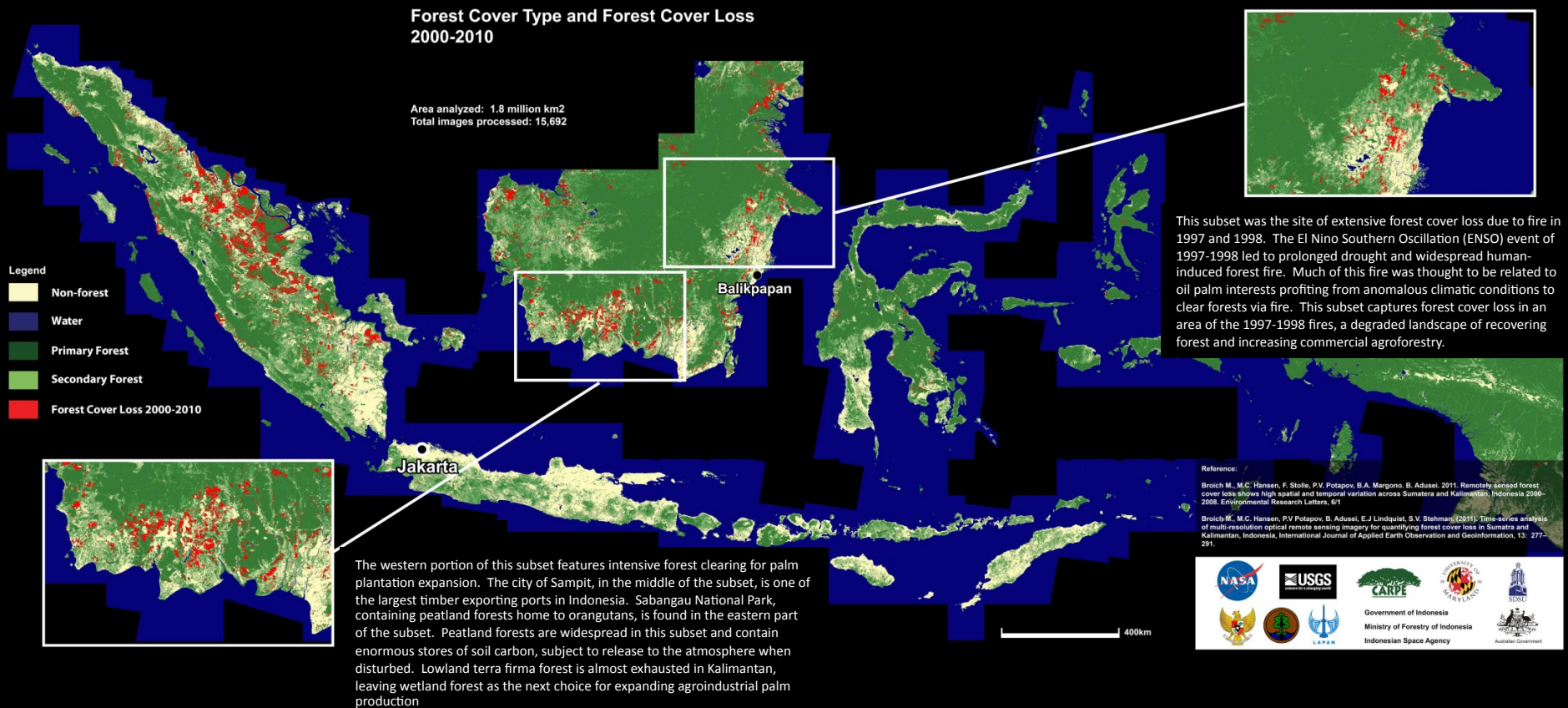
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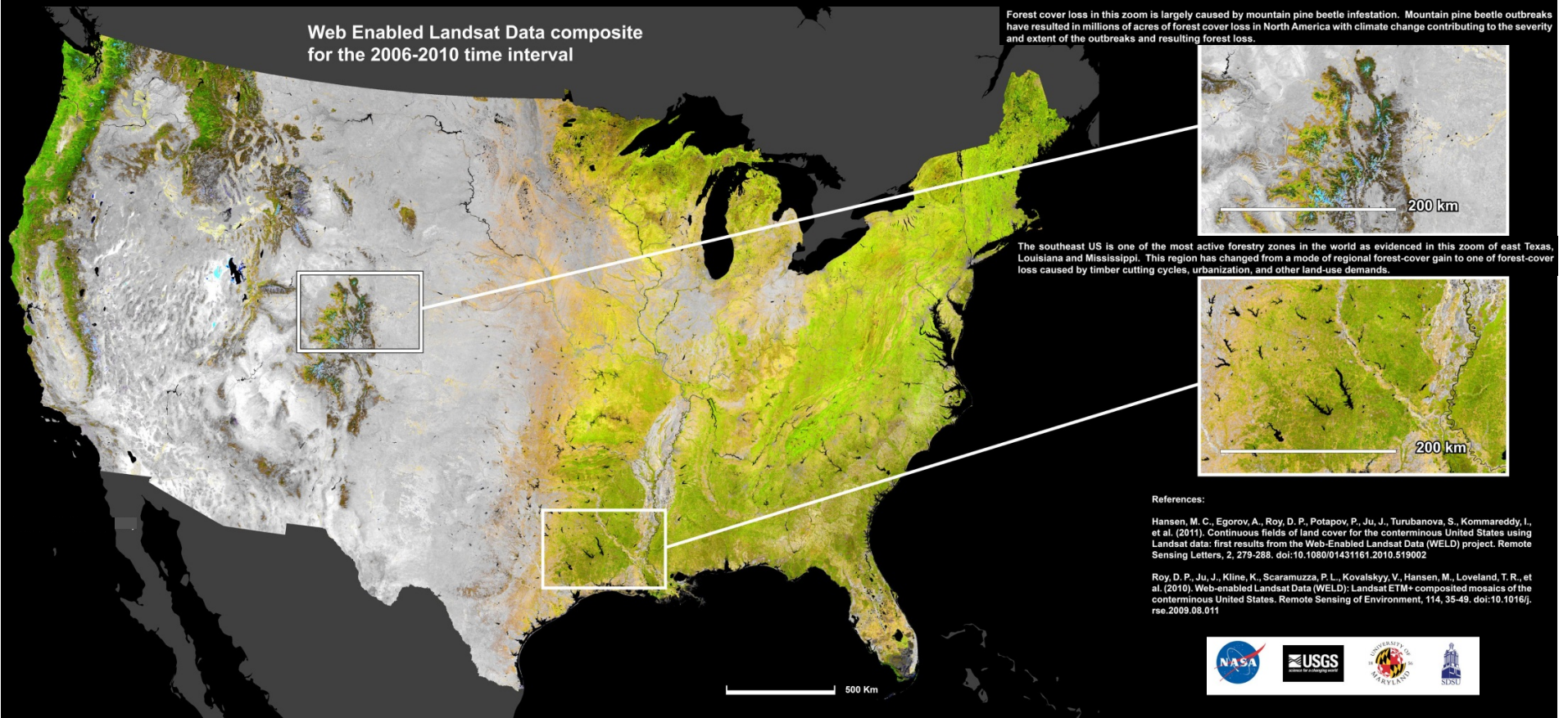


# Indonesia forest monitoring



- Total gross forest cover loss was estimated to be 92.1 thousand km<sup>2</sup> from 2000 to 2010.
- Forest cover loss increased by 53% from the 2000-2005 to 2005-2010 interval.
- The proportion of forest cover loss within primary forests versus other forest types was nearly equal, with 46% of clearing occurring within primary forests, and 54% within timber plantations, palm estates and secondary regrowth.
- The majority of mapped forest cover loss (80%) occurred in land allocation zones that permit permanent or temporary clearing, while 20% occurred where clearing is either prohibited or restricted. Effective enforcement of existing biodiversity conservation forest, watershed protection, and limited production forest land use designations could significantly reduce forest cover loss.

# United States land cover monitoring

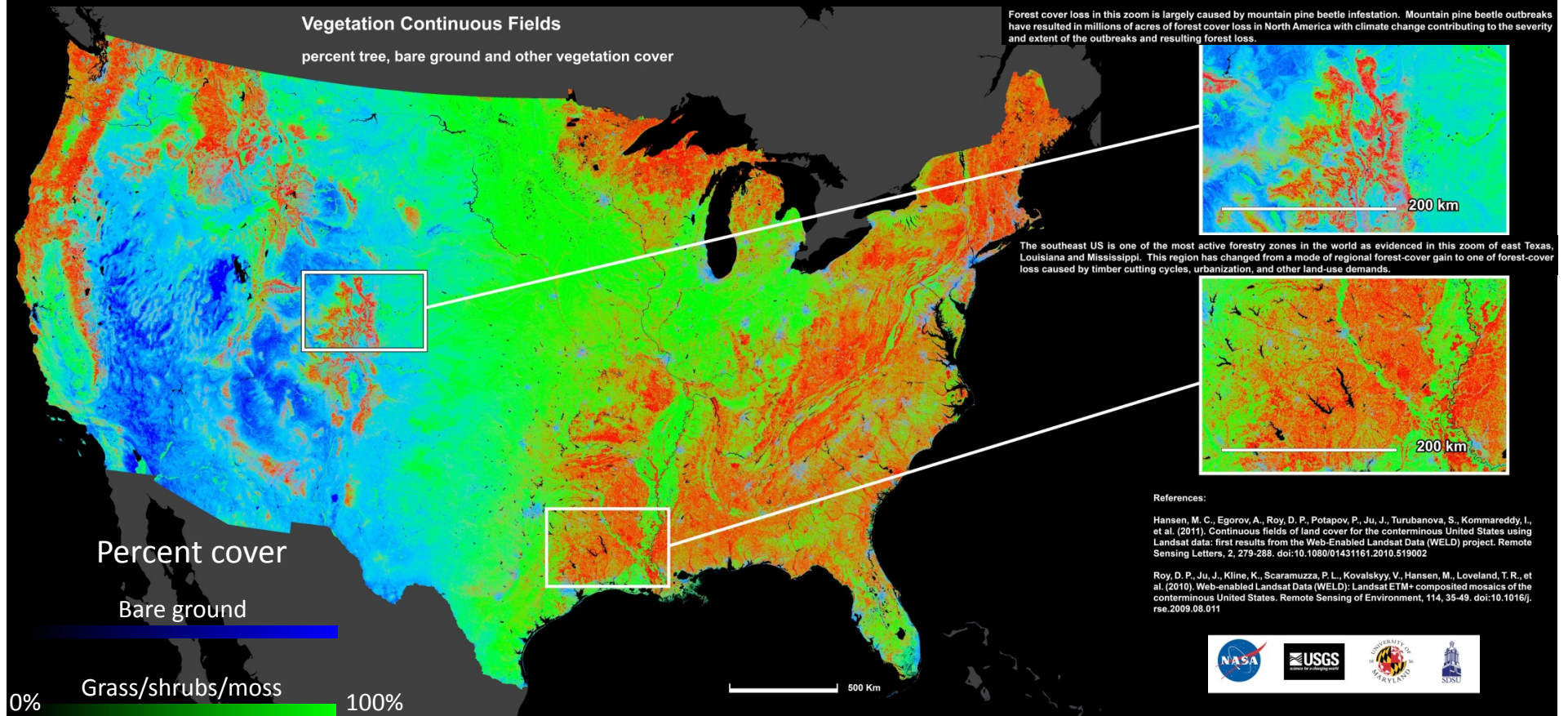


Vegetation Continuous Field (VCF) layers of 30 m percent tree cover, bare ground, other vegetation and probability of water were derived for the conterminous United States (CONUS) using Landsat 7 Enhanced Thematic Mapper Plus (ETM+) data sets from the Web-Enabled Landsat Data (WELD) project.

Turnkey approaches to land cover mapping were enabled due to the systematic WELD Landsat processing, including conversion of digital numbers to calibrated top of atmosphere reflectance and brightness temperature, cloud masking, reprojection into a continental map projection and temporal compositing.



# United States land cover monitoring



## References:

Hansen, M. C., Egorov, A., Roy, D. P., Potapov, P., Ju, J., Turubanova, S., Kommareddy, I., et al. (2011). Continuous fields of land cover for the conterminous United States using Landsat data: first results from the Web-Enabled Landsat Data (WELD) project. *Remote Sensing Letters*, 2, 279-288. doi:10.1080/01431161.2010.519002

Roy, D. P., Ju, J., Kline, K., Scaramuzza, P. L., Kovalevsky, V., Hansen, M., Loveland, T. R., et al. (2010). Web-enabled Landsat Data (WELD): Landsat ETM+ composited mosaics of the conterminous United States. *Remote Sensing of Environment*, 114, 35-49. doi:10.1016/j.rse.2009.08.011

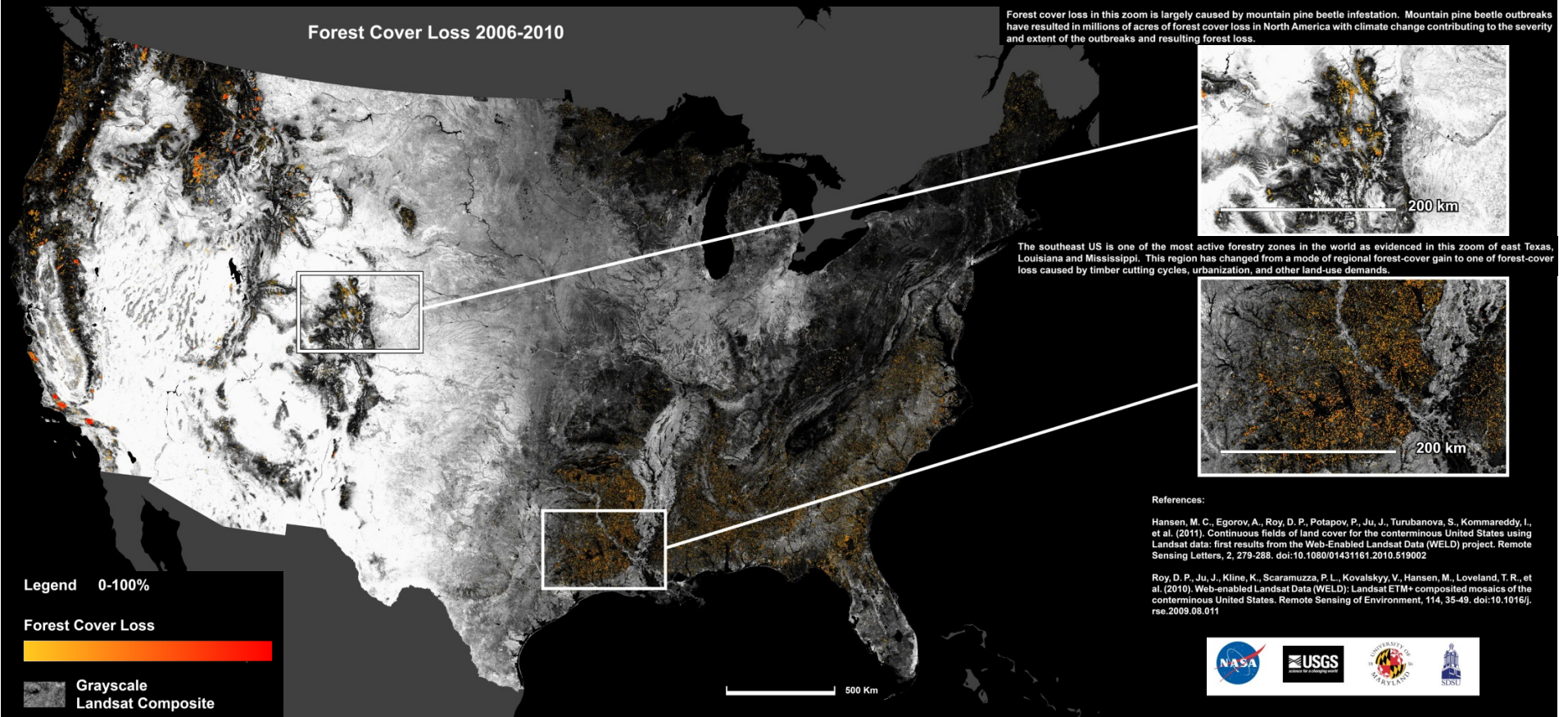


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# United States land cover monitoring



Forest cover loss was quantified for the period 2006 to 2010 using WELD inputs. A supervised classification tree algorithm was used to map per pixel probability of forest cover loss, defined as any stand-replacement disturbance at Landsat pixel scale.

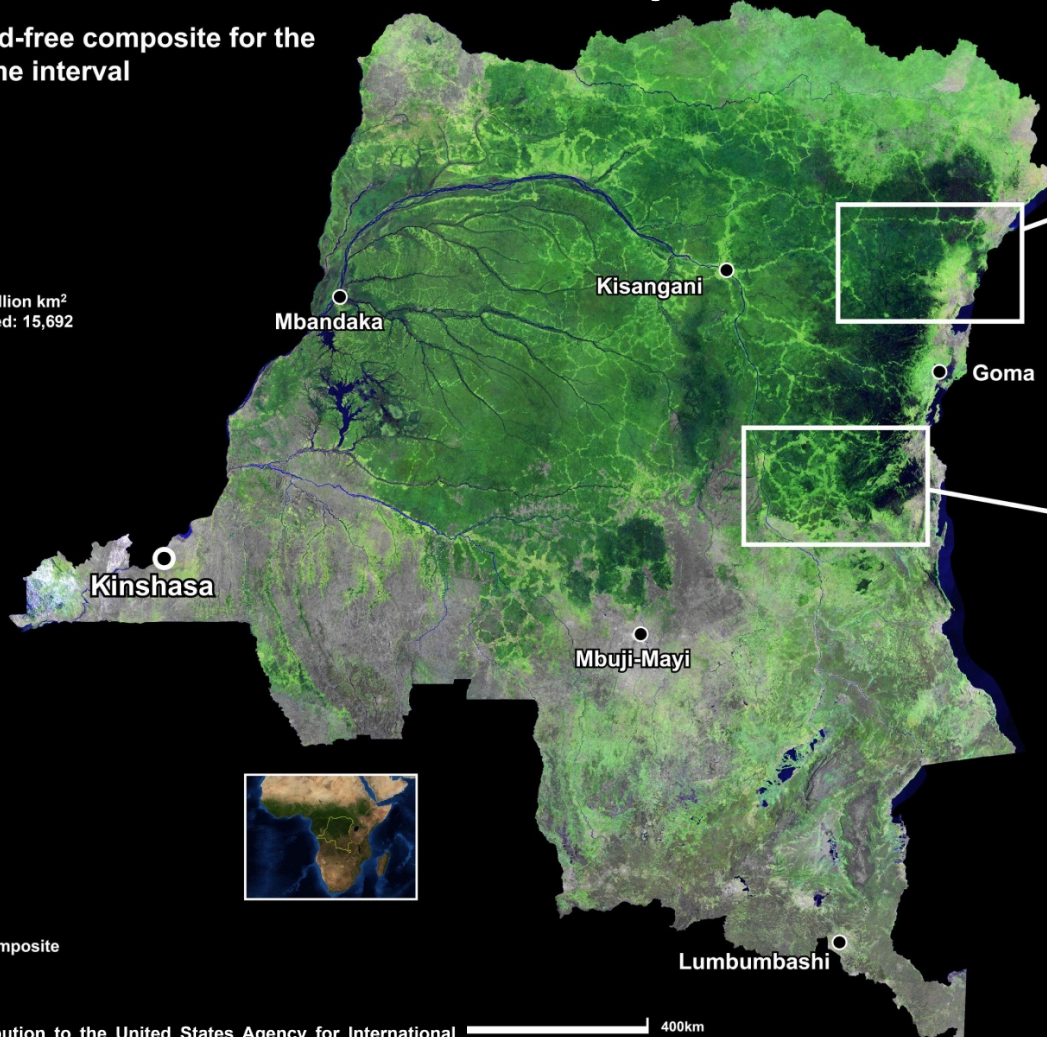
- The principal driver of forest cover loss is logging, evident in the southeast, northwest and upper Midwest of the country.
- Fire is a secondary driver, with significant forest fires found in southern California and Montana.
- Forest cover loss due to disease, including mountain pine beetle infestation, is evident in Colorado and South Dakota.
- Storm damage is another cause of forest cover loss, and include tornado tracks not evident at the scale of this graphic.



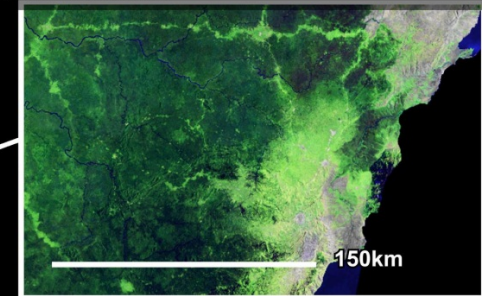
# Democratic Republic of the Congo

Landsat cloud-free composite for the 2000-2005 time interval

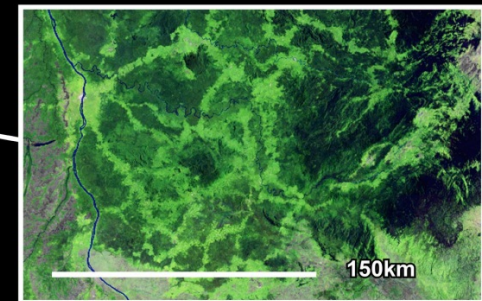
Area analyzed: 1.8 million km<sup>2</sup>  
Total images processed: 15,692



Front of forest clearing in North Kivu province within a region of persistent conflict and internally displaced populations.



Lattice of trunk roads and associated agricultural clearings in Maniema and South Kivu



Reference:

Reference: Potapov P.V., Turubanova S.A., Hansen M.C., Adusei B., Broich M., Altstatt A., Mane L., and Justice C.O. (2011) Quantifying forest cover loss in Democratic Republic of the Congo, 2000-2010. Remote Sensing of Environment (accepted)

Data and images: <http://congo.iluci.org/carpemapper/>

Legend

Landsat Composite

The map is a contribution to the United States Agency for International Development (USAID) Central African Regional Program for the Environment (CARPE), a Central Africa-wide initiative to monitor the forest resources of the Congo Basin in sustaining human livelihoods and key ecosystem services, including carbon sequestration and biodiversity.

An exhaustive mining of the Landsat ETM+ archive was performed to create the first cloud-free depictions of DRC at a medium spatial resolution. All Landsat imagery are processed to radiometrically normalized reflectance values and subsequently used to produce time-sequential image composites. Supervised learning algorithms were then applied to the time-series data sets to quantify both forest cover extent and loss.



This map is the first result of the Forêts d'Afrique Centrale Évaluées par Télédétection (FACET) initiative, a CARPE-supported collaboration between the Observatoire Satellital des Forêts d'Afrique Centrale (OSFAC), the University of Maryland and South Dakota State University.

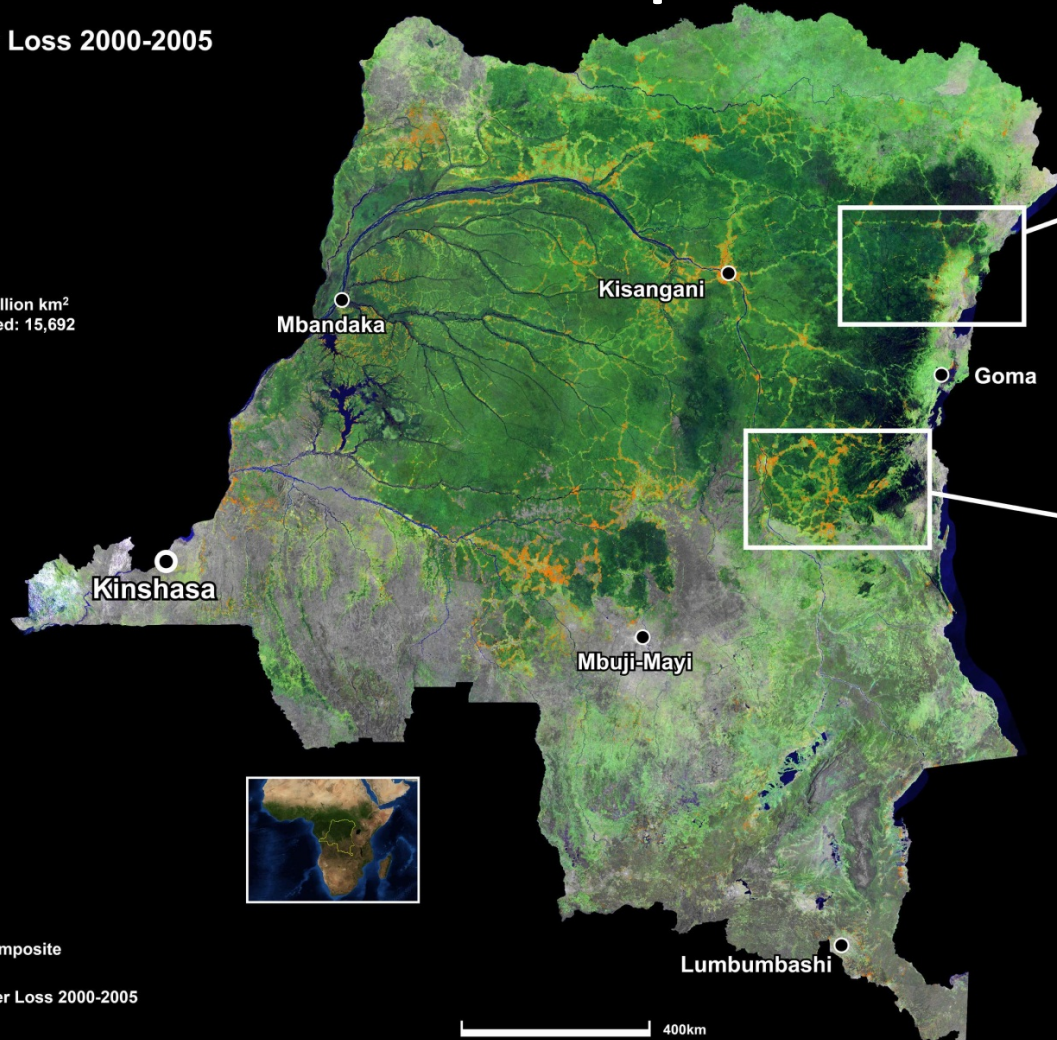
Methodological development was also supported by NASA's Land Use Land Cover Change Program.



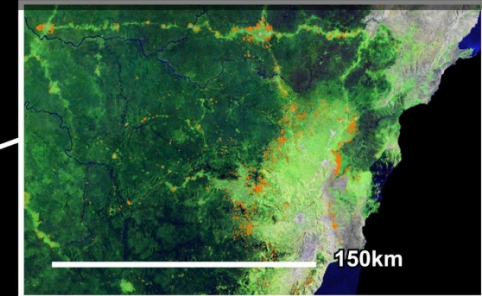
# Democratic Republic of the Congo

## Forest Cover Loss 2000-2005

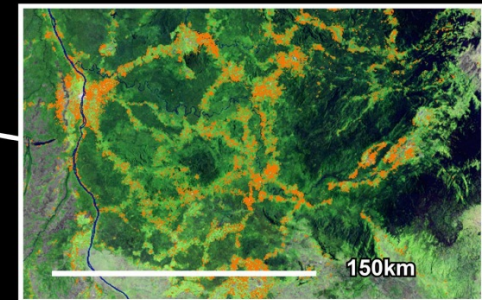
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



### Reference:

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### Legend

-  Landsat Composite
-  Forest Cover Loss 2000-2005

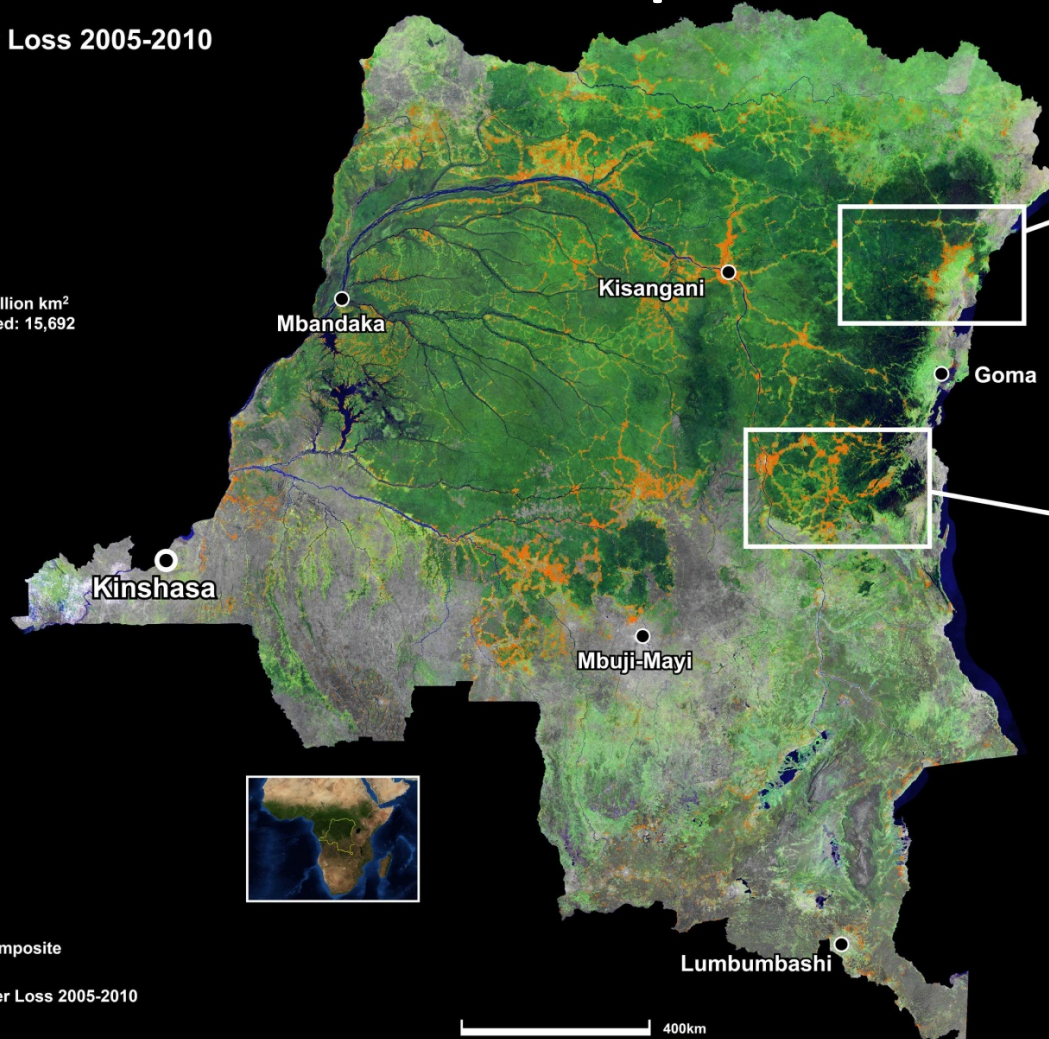




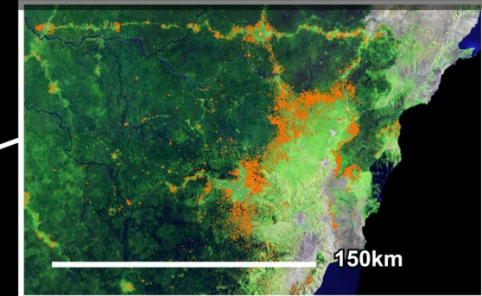
# Democratic Republic of the Congo

## Forest Cover Loss 2005-2010

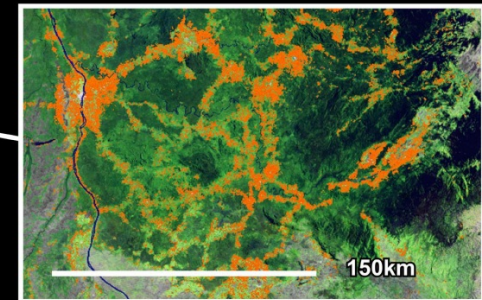
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



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### Legend

-  Landsat Composite
-  Forest Cover Loss 2005-2010



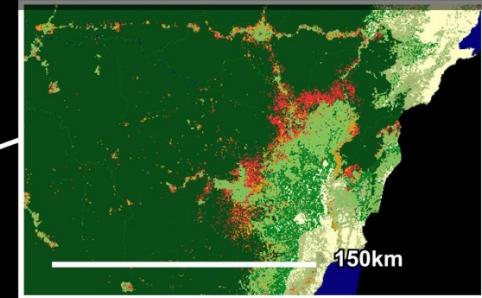


# Democratic Republic of the Congo

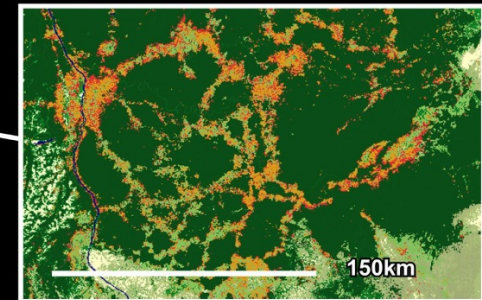
## Forest Cover Type and Forest Cover Loss 2000-2010

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Front of forest clearing in North Kivu province within a region of persistent conflict and internally displaced populations.



Lattice of trunk roads and associated agricultural clearings in Maniema and South Kivu



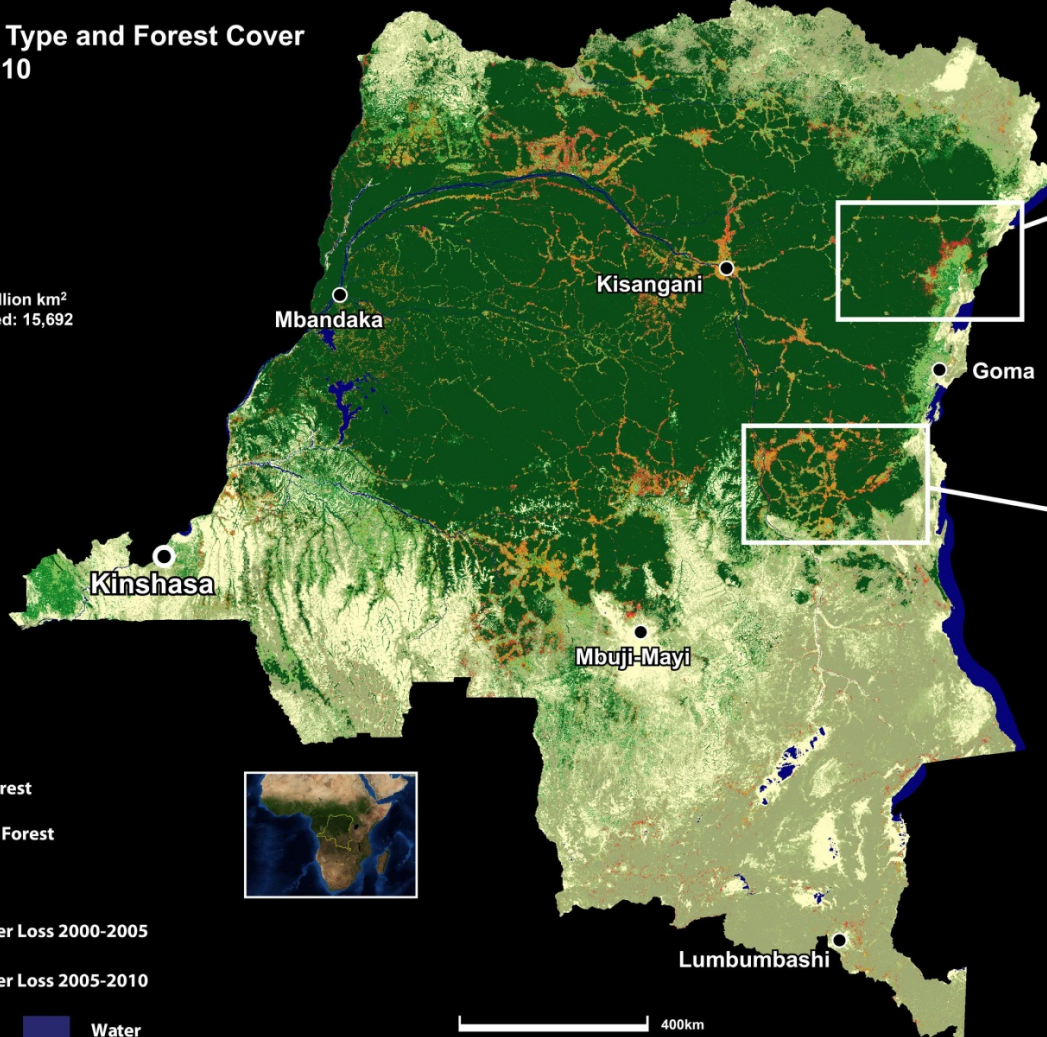
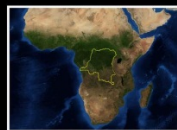
Reference:

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Data and images: <http://congo.iluci.org/carpemapper/>

### Legend

- Primary Forest
- Secondary Forest
- Woodland
- Forest Cover Loss 2000-2005
- Forest Cover Loss 2005-2010
- Non-forest
- Water



•The national year 2000 forest cover was estimated to be 1.59 million km<sup>2</sup>, with gross forest cover loss for the last decade totaling 2.3% of forest area.

•Forest cover loss increased by 14% between the 2000-2005 to 2005-2010 intervals, with the greatest increase occurring within primary humid tropical forests.

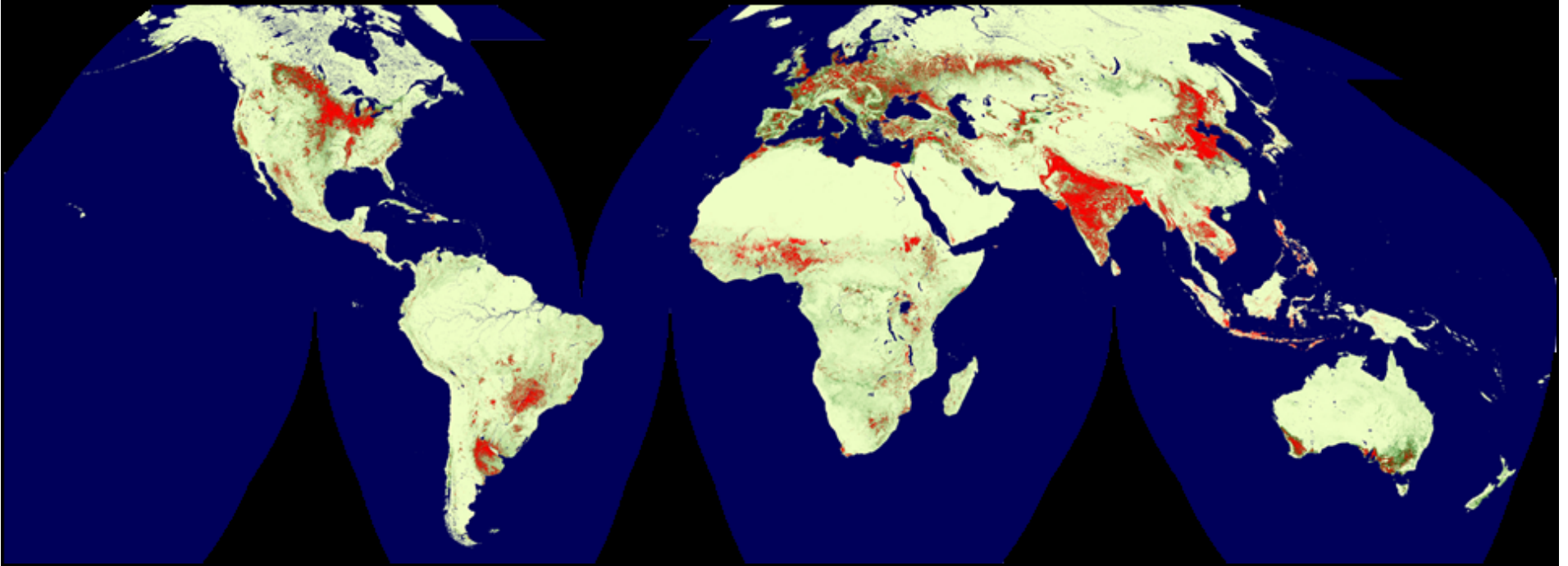
•Gross forest cover loss within protected areas increased by 64% between the two intervals.

•Results illustrate an accelerating rate of forest cover loss during the past 10 years.



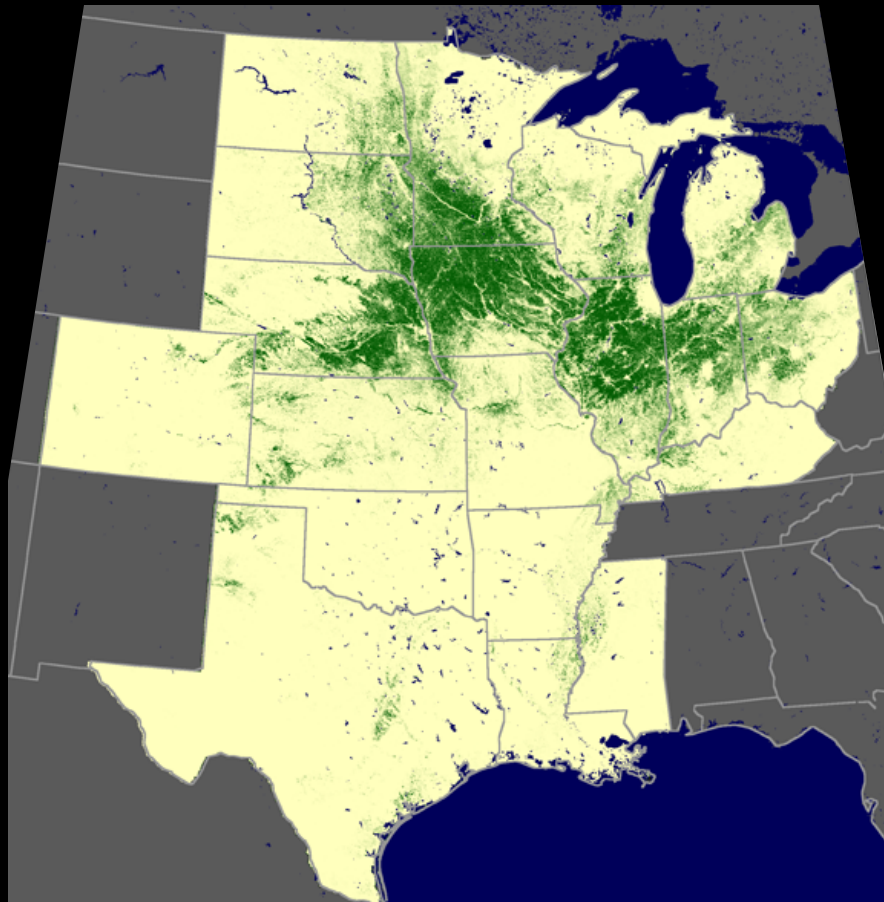


# Global Cropland Extent

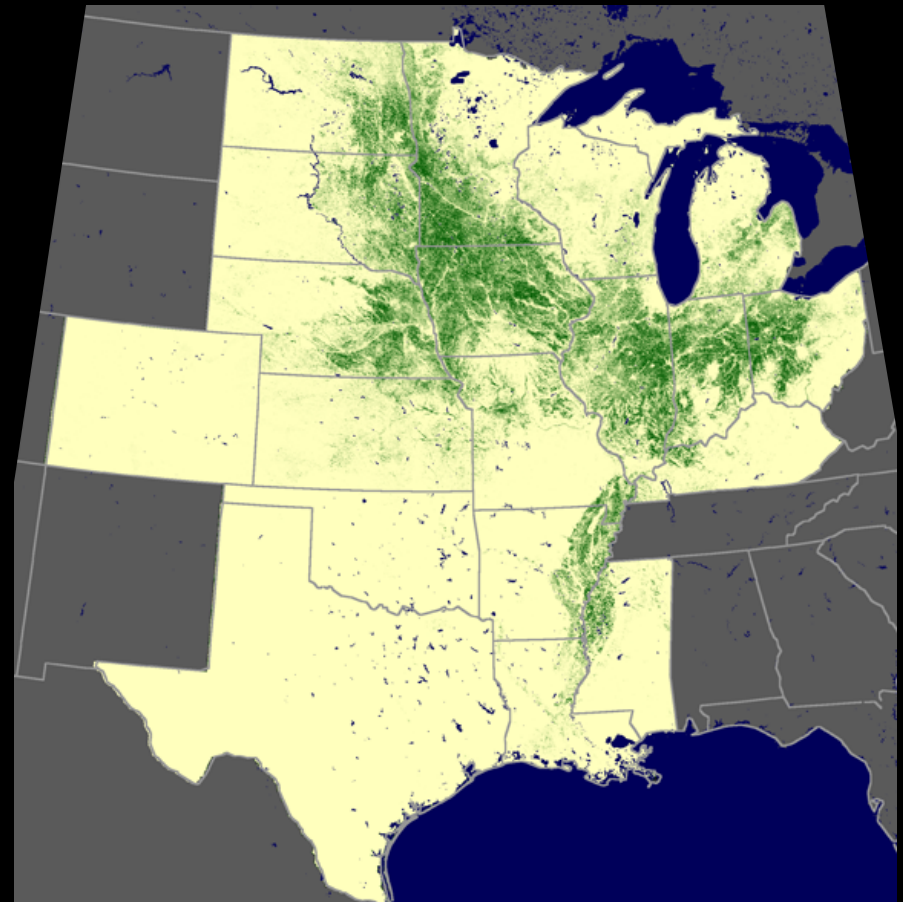


MODIS multi-year characterization of cropland probability where red matches per country USDA Foreign Agricultural Service reported cropland area

# Crop type monitoring



100  
0  
Percent corn cover 2008



100  
0  
Percent soybean cover 2008

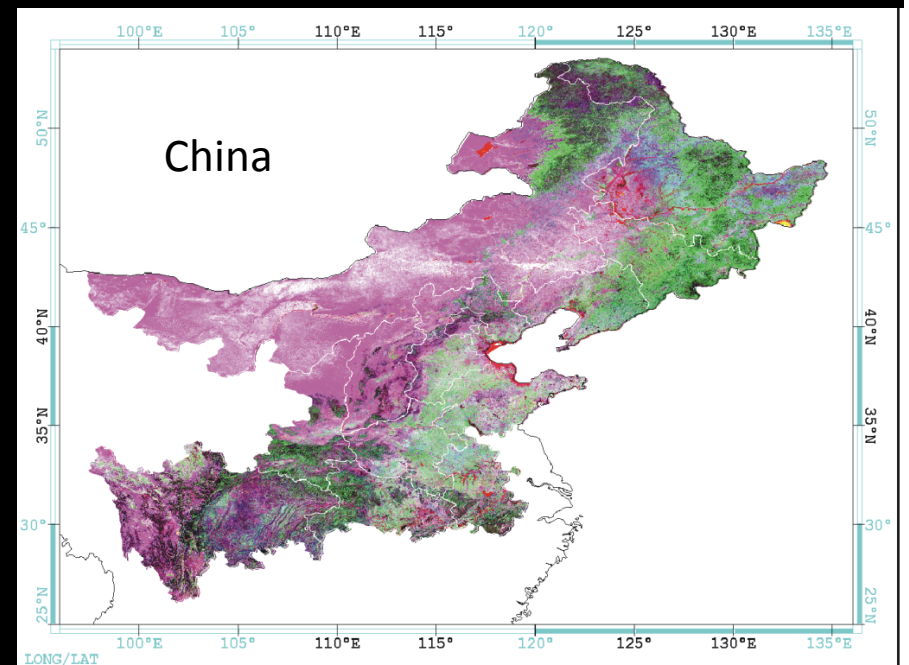
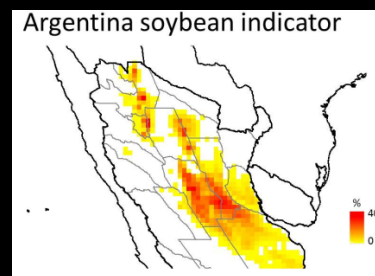
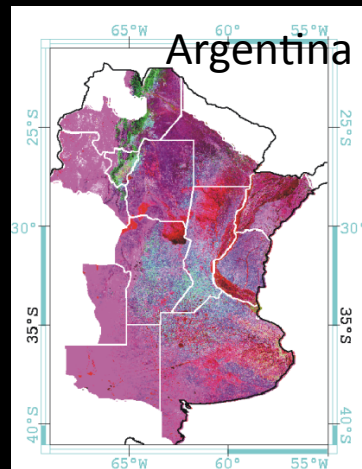
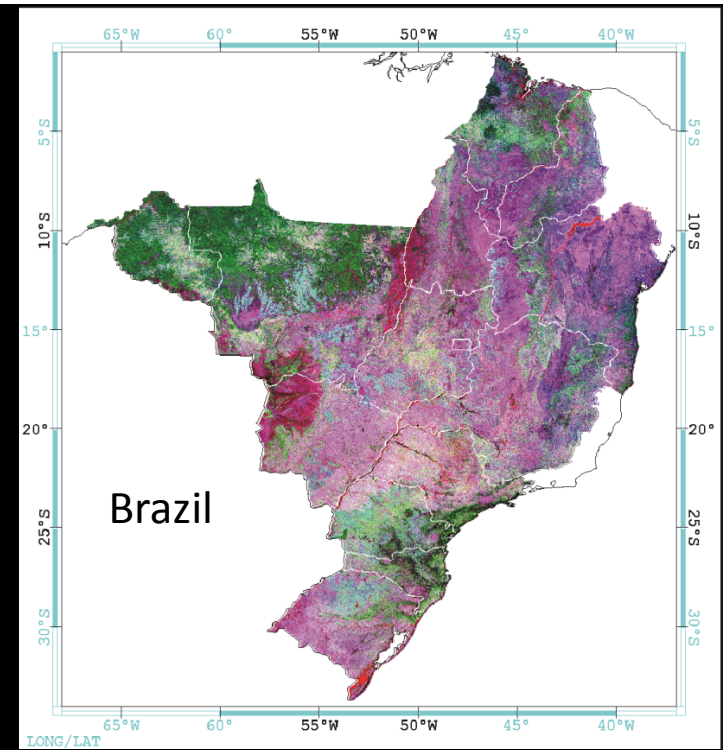
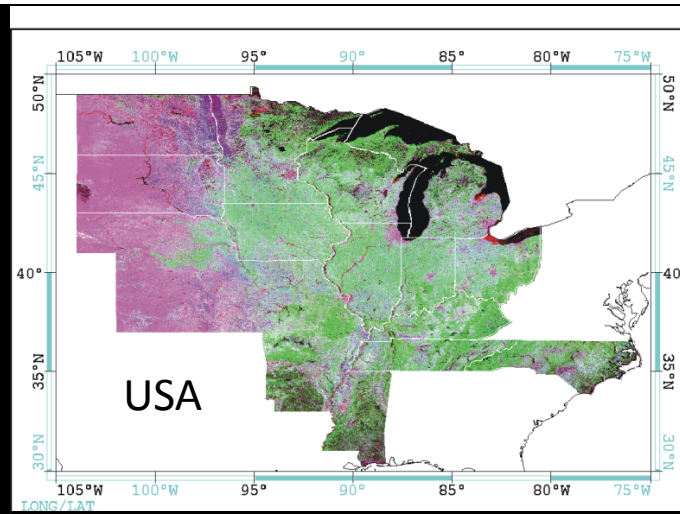
Turn-key crop type indicator maps derived using growing season MODIS time-series metrics



## Global soybean area estimation

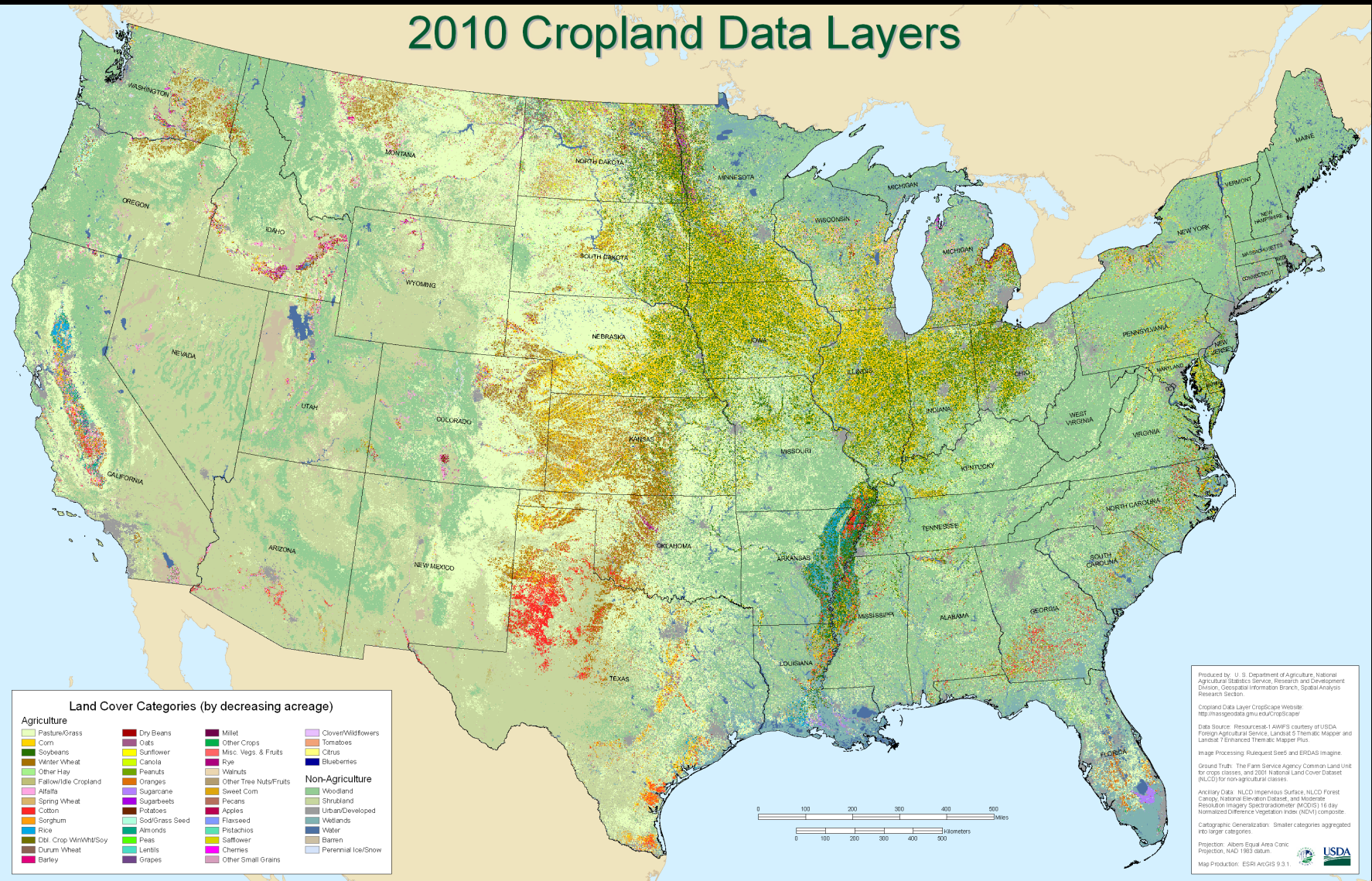
The top four soybean production countries, totaling nearly 90% of global soybean production include: top left, United States; top right, Brazil; lower left, Argentina; lower right, China. MODIS crop type (soybean) indicator maps are used to stratify and sample Landsat data for cultivated area estimation.

For each country, the administrative subset shown accounts for over 90% of national soybean acreage. Images, with a globally applied enhancement, are from MODIS median 9-year growing season metrics for red=visible red, green=near-infrared, and blue=shortwave infrared (band 7). An example turn-key MODIS soybean indicator product is shown for Argentina – here as a sampling frame for analysis of Landsat sample blocks.





# 2010 Cropland Data Layers





United States Department of Agriculture

# National Agricultural Statistics Service

A decade of mapping the nation's croplands



2002



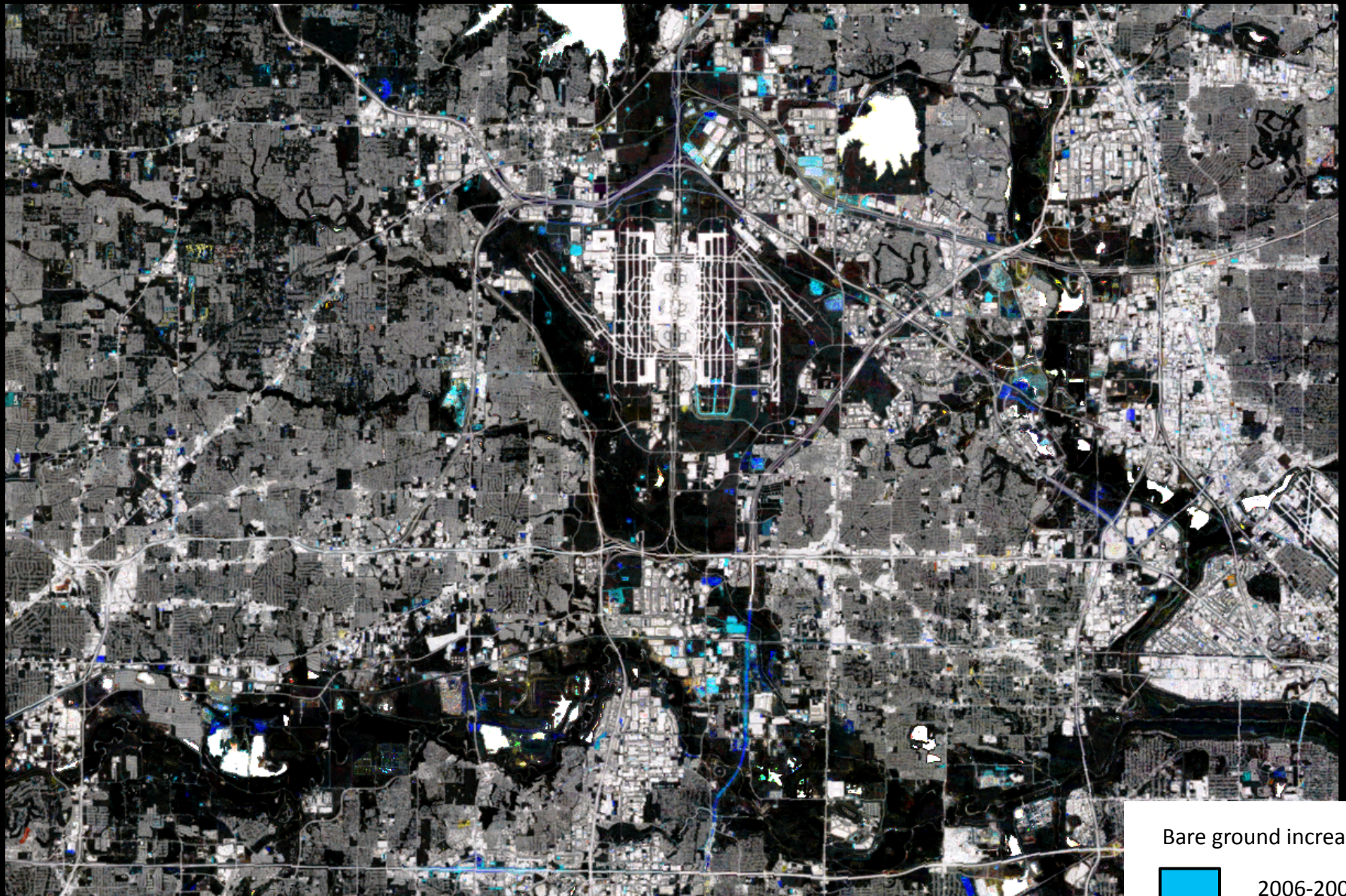
corn



soybean



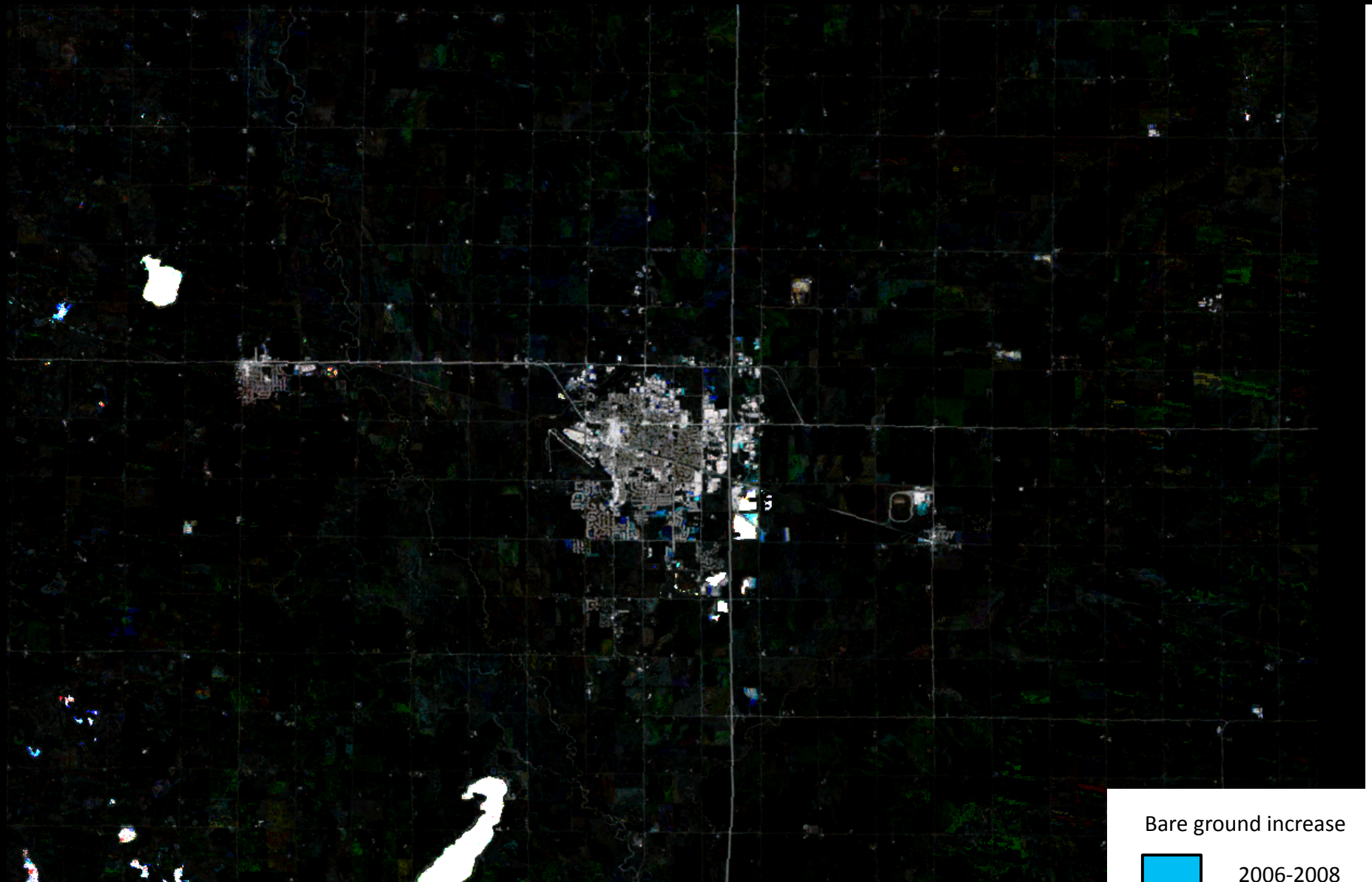
# Urbanization



Dallas-Fort Worth, TX



# Urbanization



Brookings, SD

Bare ground increase



2006-2008



2008-2010